



Introduction to Molecular Modeling and Computer Simulation

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Overview of the class

- What is Molecular Modeling?
 - Basic assumptions, graphics etc.
- Properties: Hydrophobicity, ASA, electrostatics etc.
- Techniques: MM, MD, QM
 - QSAR, Protein-ligand docking
- Hands on exercise:
 - Small Molecule building, Energy Minimization
 - Aligning protein structures using Homology
 - Pharmacophore concepts
 - Protein-Ligand Docking

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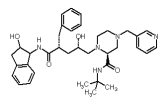
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Capabilities/Limitations Drug Design Approach

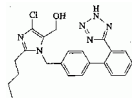
- "It is impossible to expect a molecular structure to appear on the screen of a workstation simply by asking the computer for a novel molecule that will cure cancer, is inexpensive to manufacture, and has no side-effects. Rarely does computational chemistry lead directly to drug"

Donald B. Boyd,
Indiana University, Drug Design

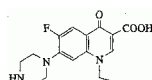
Indinavir: Antiviral
Drug/HIV/MM/MD/
Crystallography



Losartan:
Antihypertensive
agent/Structure
Activity Study



Norfloxacin: Antibiotic
/QSAR



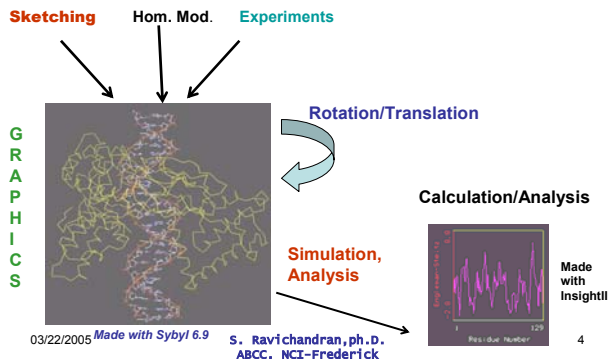
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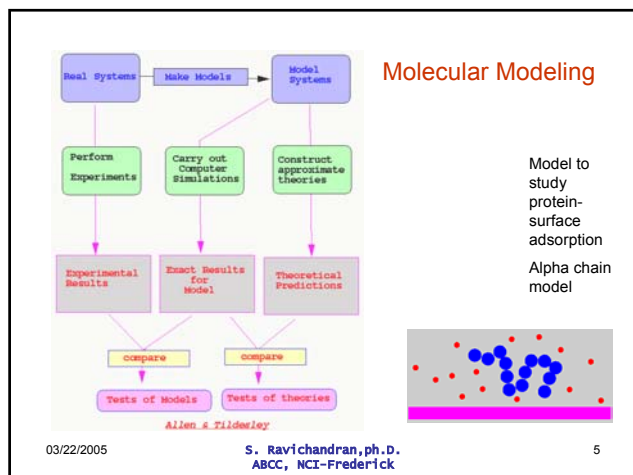
Molecular Modeling

Molecular Modeling is the science of creating/studying molecular structure and function through models and simulation



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Why Molecular Modeling?

GLY17
TYR27

26 Missing residues-a flexible loop
Loop is found to be important for the functioning of this molecule.

Advantage: 3-D structure availability
Dis-advantage: incomplete structure

How do we get the complete structure?
Molecular Modeling (bioinformatics, Homology modeling.....)

1WSA shown using Sybyl 6.9

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Applications of Molecular Modeling

- Visualization
 - Free: [Spdbv](#), [Cn3D](#), [Rasmol](#), [VMD](#) and many more (**Exercise: Spdbv, Cn3d**)
 - \$\$\$\$: Tripos, [Accelrys](#) and many more

Myoglobin (1MBO)

C-Alpha Only

Line Mode

Secondary Structure

Space Fill

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Cambridge Structural Database

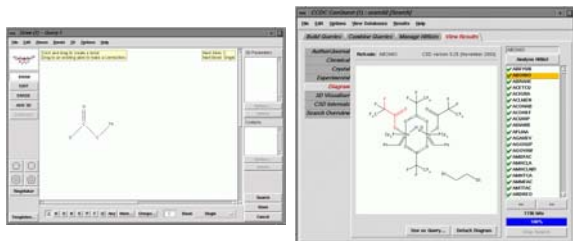
- X-ray and neutron diffraction analysis of carbon-containing molecules (up to 1000 atoms including H)
 - Organics, Organometallics, Metal Complexes
 - Peptides up to 24 residues
 - mono-, di- and tri-nucleotides
- Different Search Options:
 - Basic substructure, Substructure with constraints, 3D substructure, non-bonded interactions, Pharmacophore, Cell parameter, Journal Reference

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CSD: Substructure Search

Query

Results



7a : any halogen

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3D-Structural Database

<http://www.rcsb.org>

- NMR
 - Dynamic
 - Multiple Models (Each conformation is a model)
 - Aqueous environment
 - Limitations
 - Size of molecule
 - < 30kD
- Example
 - [1DV0](#), [1UBA](#)

- X-ray
 - Static
 - Only one model
 - Crystal
 - Limitations
 - Not limited by size

- Examples
 - [7LYZ](#)

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Structural Databases

- These crystallographic databases gives information w.r.t a crystal environment
 - Proteins NMR studies have proved that the structure in the crystal phase and solution phase are almost same but for small molecules this may not be the case
 - These databases do not cover the whole spectrum because some of the molecules cannot be crystallized

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No Experimental Structure & Homology Modeling

- No 3D structure but has homologous PDB entries
 - Can exploit homology to model the unknown protein
 - Accelrys (Modeller), Swiss-Model, Tripos (Matchmaker,)
- No 3D structure but do not have any homologous PDB entries
 - Threading, Reverse Folding
 - Tripos (GenFold)

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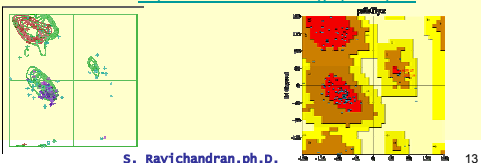
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Quality (model) check!

- **Procheck**: Stereo-chemical quality of the protein and residue by residue analysis in figures

<http://www.biochem.ucl.ac.uk/~roman/procheck/procheck.html>

- **PDBREPORT**: <http://www.cmbi.kun.nl/qv/pdbreport>



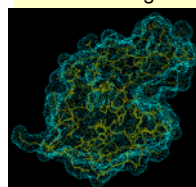
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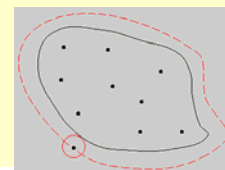
Important properties

- **Solvent-Accessibility (SA)**
 - SA help us to know what groups are on the surface-solvent exposed
 - Can give hints on the possible interaction with ligands etc.



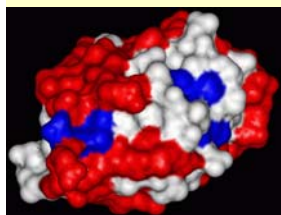
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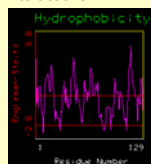


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Molecular Surface



Hydrophobic residues on the surface of the protein for some reason! Protein-Protein Interactions



Lysozyme, Hydrophilic red, hydrophobic blue, InsightII, subsets are created using Engleman-Steitz algorithm

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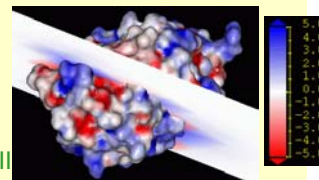
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Electrostatics

- **Delphi**: software to calculate electrostatic properties-Protein-Ligand interactions
 - Calculate electrostatic potential
 - Effects of site-directed mutagenesis
 - Electrostatic contribution to the solvation energy
 - Interface to InsightII

Picture made with InsightII



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Computer Simulation

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Molecular Mechanics (MM)

- What is Molecular Mechanics?
 - MM is a energy refinement procedure. Refinement process is usually called Minimization or Energy Minimization.
 - Assumption: Energy minimized structure is closer to the stable geometry and probably closer to experimental structure.
- Where Energy Minimization is usually employed?
 - Molecule Building, Homology modeling, Conformational Search, PDB file refinement

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MM

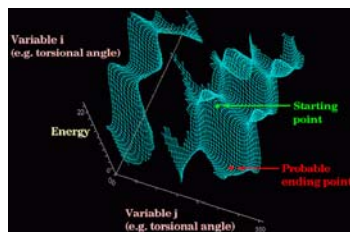


Image from NIH Molecular Modeling pages

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Basic assumptions of MM



- Electrons and nuclei are lumped together
- Molecules are assumed to be balls (point masses) and connected to others by bonds (springs)
- Total energy of the system is an important property and it is usually computed as a sum of independent energy terms.
 - Electrostatic energy term: $E_{ele} = (q_i q_j) / (4\pi\epsilon_0 r^2)$

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MM



- Each atom/bond in a molecule or amino acid is identified by

- 1) Atom type 2) Residue type 3) hybridization type 4) Bonding info. 5) Charges 6) Coordinates

Carbon-di-oxide

- Atom types C1, O2; Hybridization: sp, sp²; Bonding info: C1 is bonded to two O2 atoms; Coordinates: x,y and z; Charges: (C) 0.372, (O) -0.186

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ForceField

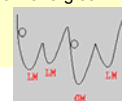
- ForceField is an analytical Functional form for the independent energy terms and parameters

Bond length = $K(b-b_0)^2$
Simple Functional Form

$$E_{\text{pot}} = \sum \frac{1}{2} K_b (b - b_0)^2 + \sum \frac{1}{2} K_\theta (\theta - \theta_0)^2 + \sum \frac{1}{2} K_\phi (1 + \cos N\phi)^2 + \sum \frac{1}{2} K_x (x - x_0)^2 + \sum (|B| r)^{-12} - (A/r)^6 + \sum (q_i q_j / r)$$

- Different Flavours of Energy Minimization:

- Steepest Descent (SD) and Conjugate-Gradient (CD)
 - SD is used to relieve overlaps and so good at start
 - CD is slow but can lead to structures with low energies. Do not get trapped in local minima like SD!
 - Simulated Annealing



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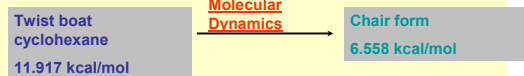
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MM

- Limitations: Not possible to reach Global minimum.

- Two alternative methods:
MD or stepwise rotation of bonds

Example



Cyclohexane remains in twist boat form in Molecular Mechanics

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Molecular Dynamics (MD)

- Time dependent behavior of the molecular system
 - Local vibrations, conformational change of proteins and nucleic acids
- MD is based on classical Newton's motion
 - Equation of motion: $F = m \times a$
- A typical MD run consist of the following steps
 - Set Initial configuration/Velocity; Heating, Equilibration, Production, Saving configurations
- Applications: Dynamical Properties, MD can take information from NMR to perform a restrained MD.

Gromacs, Amber, Charmm, VMD, NEMD

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Quantum Mechanics (QM)

- Need for QM
 - MM and MD do not consider electrons explicitly (Born-Oppenheimer approximation)
 - When a drug molecule interact with a receptor. Primary interactions occur between the electron clouds. ELECTRONIC influence cannot be ignored always.
 - MM and MD cannot answer questions related to
 - Bond-forming or bond-breaking
 - Molecules not in ground state

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QM

- Basics: $H\Psi = E\Psi$ Shrodinger's Equation E =Energy, Ψ = Wave Function.
 - Solve S.E to get the Energy and Wave Function, which inturn can be used to extract electronic properties (electron density etc.)
 - *ab-initio*, semi-empirical (AM1, etc.)
- QM can be used in conformational search and energy minimization
- Flavors: MOPAC, GAMESS etc.
- Applications: Minimization for small molecules, for conjugated systems, Descriptors for QSAR, Partial charges, transition state geometries & energies

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Advanced Techniques

- MC (Monte-Carlo), Brownian Dynamics, QM/MD

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Advanced Topics

- Protein-ligand Docking
 - AutoDock
- QSAR

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Protein-Flexible ligand Docking

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Docking

- Fitting a small molecule (drug molecule) into a protein
- Docking two proteins together
- Things you need:
 - Protein PDB X-ray/NMR
 - Homolgy Model Databases
 - Small Molecules CSD X-ray
 - Sketching
 - Software: Dock, AutoDock, Ludi, FlexX etc
 - Disk-space, CPU

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Docking

- Attempt to identify the binding mode of L-R complex by searching conf/orient. space for a geometry with favourable binding energy
- Questions to ask before you begin
 - How good is the protein structure?
 - Resolution (~2 Å), R-factor (below 20%), free R-factor below 30%, B-factor (active site), experimental info. 40 Å² indicate problems, Crystal packing forces, Symmetry related copies of protein may influence protein conformation

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Docking

- NMR 1model/multi-models, which one to keep?
 - High resolution structure should have an order of 20 (distance or dihedral) restraints/residue
 - RMSD variation between ensemble of structures
 - < 1 Å backbone atoms
 - < 1.5 Å all atoms
- Are there bound ions/water mols/ligands?
 - Remove them/keep them ??
- Is the crystal structure appropriate for your modeling experiment ?
 - Inhibitor for kinases-which form active/inactive?

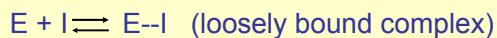
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Docking

Basics:



Why is it difficult?

2 rigid molecules-6 degrees of freedom

14 rotatable bonds

1028 variations

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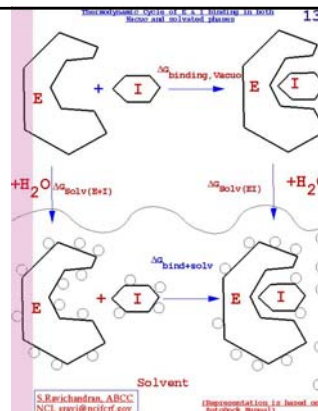
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Docking

Thermodynamic Cycle approach

Popular Methods of Docking

1. Simulated Annealing
2. Genetic Algorithms



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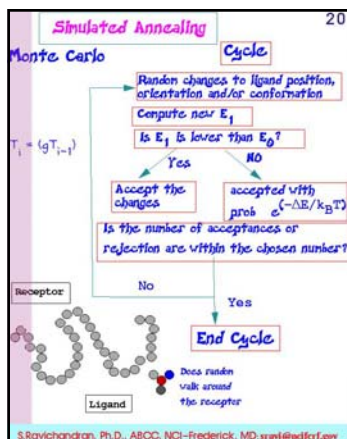
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Docking

Annealing: A process in which the T of the system is reduced (slowly) until the material crystallizes in a single crystal (correspond to global FE)

SA can do both global and local search

Global: High T
Local: Low T



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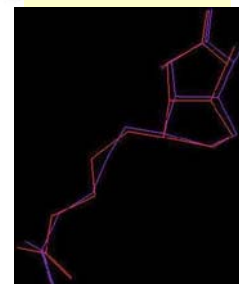
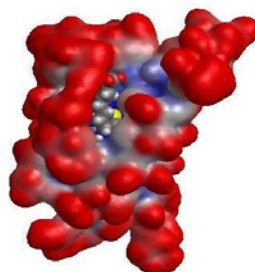
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Test Case Using AutoDock

Streptavidin/Biotin complex (1stp)

P.C. Weber, D.H. Ohlendorf, J.J. Mendelovskii, and F.R. Salemme (1992)



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QSAR

- In the process of searching for lead compounds
 - ∞ number of possible analogues can be made
 - Substituents on aromatic, functional groups etc.

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QSAR

- What is QSAR

Quantitative Structure Activity Relationships

Addresses two questions:

- What feature of a molecule affect its activity?
- What can be modified to enhance properties?

Quantitative in that a mathematical model is used to account for the observed activity

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Applications of QSAR

- Drug Design
 - Predictions for new experiments
 - Correlate different kinds of biological activity
 - Elucidate the mechanism of new drugs

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Simple Linear Regression

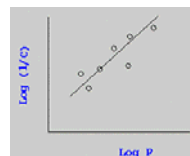
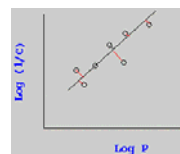


Idea is to see whether there is any relationship between x & y

Why 1/C? Most active achieve defined activity at a lower C.

In reality we can synthesize a series of compounds which can affect only Log (p)

Activity expressed as 1/C
C = concentration of a drug molecule required to produce expected level of biological activity



$$Y = k_1x + k_2$$

k_1 and k_2 are constants

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Physicochemical Properties

- Hydrophobicity, Electronic & Steric
- Quantitative description of hydrophobicity is comparatively easy
 - Partition coefficients ($\log P$) or π (hydrophobic)

$$P = \frac{\text{Concentration of drug in octanol}}{\text{Concentration of drug in aq. soln.}}$$

Hydrophobic (High P); Hydrophilic (Low P)

Binding of drugs to Serum Albumin

$$\log(1/c) = 0.75 \log P + 2.3 \quad (\text{based on 40 Compounds})$$

Binding is determined mainly by hydrophobicity.

Is this true for all P values?

True for small ranges of P (1-4). What happens at high P values?

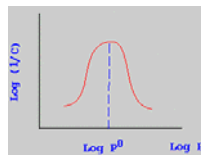
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$\log(p)$

Parabolic Curve



General Equation;

$$Y = (-) k_1(\log P)^2 + k_2 \log P + k_3$$

Can we extend it for any anaesthetics?

Does the $\log(p)$ increase infinitely?
Reaches optimal value and decreases.

Can we describe this by an equation?

Parabolic Curve

What happens at higher P values?

Why do we see such a behavior?

Are there drugs which depend only on $\log P$?

Yes, Anaesthetics which enter cell-membranes and affect the CNS activity- No drug-receptor interactions

$$Y = -0.22 (\log P)^2 + 1.04 \log P + 2.16$$

Gl. Eq. for range of anaesthetic ethers

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$\log(P)$

- It has been shown that any compound with a $\log P$ close to 2 can efficiently enter CNS and act as anaesthetic
- What would you do if you want your drug molecule to get stuck in the CNS?

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Substituent Hydrophobicity constant (π)

π_{all} Aliphatic Compounds
 π_{Ar} Aromatic Compounds

- $\log(p)$ values represent the hydrophobicity for the whole compound. To calculate $\log(p)$ we need to synthesize the molecules.

Is there anyway to quantify hydrophobic effects of functional groups?

- $\pi = \log P_X - \log P_H$

X	CH ₃	t-Bu	OH	OMe	CF ₃	Cl	Br	F
π_{all}	0.5	1.68	-1.16	0.47	1.07	0.39	0.60	-0.17
π_{Ar}	0.52	1.68	-0.67	-0.02	1.16	0.71	0.86	0.14

How does this solve the problem?

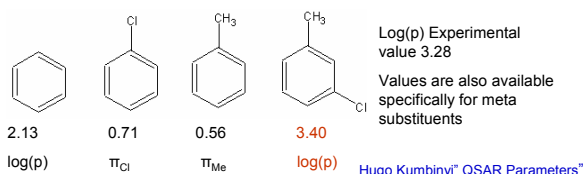
Still the lead compound $\log P$ has to be determined experimentally. Once it is known then the analogues can be calculated using π

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Substituent Hydrophobicity constant (π)



Quantum Mechanical Descriptors: HOMO (Ionization Potential), LUMO (e- affinity) etc.

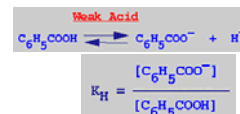
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Electronic Effects

- Hammett substitution constant σ
- It is a measure of electron-withdrawing or electron donating ability of a substituent
- For substituent benzoic acids
– Hammett S.C: $\sigma_X = K_X/K_H$



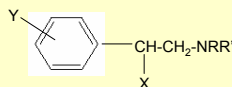
Molar Refractivity (MR): Bulkness of the drug molecule
 $MR = [(n^2 - 1)/(n^2 + 2)] (MW/\rho)$
 n refractive index, MW Molecular Weight, ρ Density

Hansch Equation

- Relation of biological activity to more than one parameter

– QSAR Equation: $\log(1/C) = 1.22 \pi - 1.59\sigma + 7.89$

Adrenergic blocking activity of β -halo-arylamines



Log(1/C) increases if the substituents has + π value and – σ value (Hydrophobic & Electron donating)

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Statistical Analysis

- R-squared (r^2)
 - Is the correlation coefficient
 - Goodness of a fit

$$r^2 = 1 - \frac{\sum (Y_{obs} - Y_{pred})^2}{\sum (Y_{obs} - Y_{mean})^2}$$

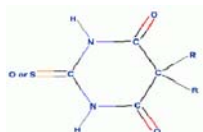
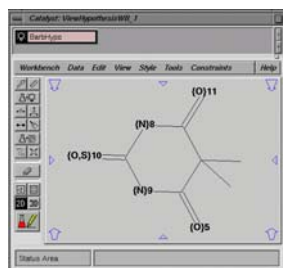
= 1 perfect fit
 = ≥ 0.95 good model
 = ≤ 0.70 Poor model

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Substructure Search



Substructure for generic barbiturate

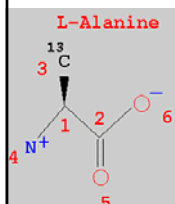
Catalyst 4.9 Accelrys Inc.

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49

MDL 2D file format (CTFILE)



```

6 5 0 0 1 0      3  V2000      Counts Line
-0.6622 -0.6342  0.000 C  0  0  0  0  0
-0.6622 -0.3000  0.000 C  0  0  0  0  0
-0.7201  2.5817  0.000 C  1  0  0  0  0 Atom
-1.8622 -0.3695  0.000 N  0  3  0  0  0 Block
0.6220 -1.8037  0.000 O  0  0  0  0  0
1.9464  0.4244  0.000 O  5  0  0  0  0
1 2 1 0 0 0
1 3 1 0 0 0
1 4 1 0 0 0
2 5 2 0 0 0
2 6 1 0 0 0
M 000 2 4 1 6 -1  Properties Block
M 000 1 3 13
M 000
    
```

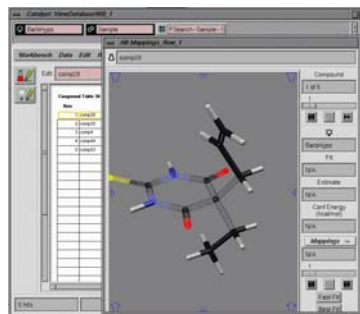
Connection
Table (Ctab)

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50

Substructure Search



Hits from the **Fast Flexible Search Database/Spreadsheet Search** on a sample database

Options to save the hits

Fit the hits to the hypothesis

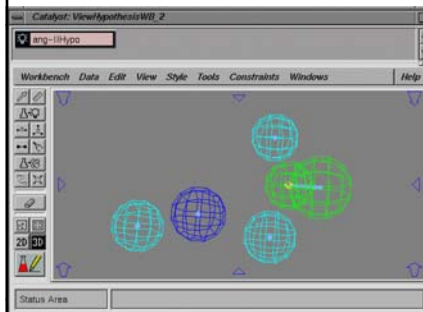
.....
.....

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51

3D-Search



Cyan Hydrophobes
Blue Neg Ionizable
Green HB acceptor

Once you have identified a set of compounds that exhibited activity for the same assay. Use them to generate a 3D hypothesis

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52

Hands-on Exercise

- Instructions in the web-link
– <http://nciiris.ncifcrf.gov/~ravichas/MM/MM.htm>

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53

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- Molecular Modeling and Simulation, T. Schlick (2002)
- Molecular Modeling: Principles and Applications A.R. Leach (2001)
- Computer Simulation of liquids, M.P. Allen and D.J. Tildesley (1989)
- Bioinformatics: A practical Guide to the analysis of Genes and Proteins, Edited by A.D. Baxevanis and B.F.F. Quellette (2001)
- Bioinformatics Basics, H. H. Rashidi and L.K. Buehler (2000)

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54

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- Developing Bioinformatics Computer Skills, C.Gibas and P. Jambeck (2001)
- Introduction to Bioinformatics: Atwood and Parry-Smith (1999)
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- Discovering Genomics, Proteomics & Bioinformatics, A. M. Campbell and L. J. Heyer (2003)

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55

Selected Reference Books (QSAR)

- **Molecular Modelling: Principles and Applications**, 2nd Edition, Andrew R. Leach
- **Encyclopedia of Computational Chemistry, 5 Volume Set** by Paul Von R. Schleyer (Editor), Paul Von Rague Schleyer
- **An introduction of QSAR Methodology**, Allen B. Richon and Stanley S. Young, Network Science (1997)

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56